

PERIODIC AND APERIODIC BEHAVIOR IN DISCRETE
ONEDIMENSIONAL DYNAMICAL SYSTEMS

ADA149288

by

JEAN-MICHEL GRANDMONT

TECHNICAL REPORT NO. 446
April 1984

A REPORT OF THE
CENTER FOR RESEARCH ON ORGANIZATIONAL EFFICIENCY
STANFORD UNIVERSITY

Contract ONR-N00014-79-C-0685, United States Office of Naval Research

THE ECONOMICS SERIES

INSTITUTE FOR MATHEMATICAL STUDIES IN THE SOCIAL SCIENCES

FOURTH FLOOR, ENCINA HALL

STANFORD UNIVERSITY
STANFORD, CALIFORNIA



PERIODIC AND APERIODIC BEHAVIOR IN DISCRETE
ONEDIMENSIONAL DYNAMICAL SYSTEMS

by

Jean Michel Grandmont

¶

Technical Report No. 446

April 1984

A REPORT OF THE
CENTER FOR RESEARCH ON ORGANIZATIONAL EFFICIENCY
STANFORD UNIVERSITY

Contract ONR-N00014-79-C-0685, United States Office of Naval Research

THE ECONOMICS SERIES

INSTITUTE FOR MATHEMATICAL STUDIES IN THE SOCIAL SCIENCES
Fourth Floor, Encina Hall
Stanford University
Stanford, California
94305

011985075

PERIODIC AND APERIODIC BEHAVIOUR IN
DISCRETE ONEDIMENSIONAL DYNAMICAL SYSTEMS

by

Jean-Michel Grandmont*

1. Introduction

The theory of onedimensional nonlinear difference equations underwent considerable progress in recent years, as the result of the efforts of theorists from several fields - in particular from physics - to get a better understanding, by making use of the notion of the "Hopf's bifurcation," of the appearance of cycles and of the transition to aperiodic or "chaotic" behaviour in physical, biological or ecological systems. These new developments seem to be potentially very useful for the study of periodic and aperiodic phenomena in economics. Parts of this theory have been indeed already used in economic or game theory by Benhabib and Day [1981, 1982], Dana and Malgrange [1981], Day [1982, 1983], Grandmont [1983], Jensen and Urban [1982], Rand [1978].

The aim of this paper is to present some of these new developments in a compact form which will be, it is hoped, useable by economic theorists. The emphasis will be on the mathematical results of the theory, rather than on its possible applications.^{1/}

Our basic reference will be Collet and Eckmann's book [1980] -

*This research was sponsored by Office of Naval Research Contract N00014-79-C-0685 at the Institute for Mathematical Studies in the Social Sciences at Stanford University, by the French Commissariat General du Plan and by the University of Lausanne. I wish to thank very much Rose-Anne Dana and Pierre Malgrange who introduced me to the mathematics of the subject. I had also very useful conversations with Philippe Aghion, Pierre Collet, John Geanakopoulos and Dominique Levy.

thereafter denoted "CE." In order to simplify the presentation, we shall use in a few places stronger assumptions than in CE's book, which means that the reader interested in the more general (but more complicated) case and who wishes to look for complements will have to go back to their book. The definitions and the statements of the results will be self-contained. However, in the proofs of a few facts, we shall use freely the concepts introduced by CE, but we shall indicate where to find the appropriate definitions in that book.^{2/}

2. Onedimensional Nonlinear Difference Equations

We are concerned thereafter with the difference equation $x_{t+1} = f(x_t)$, in which f is a function that maps the interval $[a,b]$ into itself. The object of the theory is the study of the existence (and the stability) of periodic solutions of this difference equation. To this effect, one defines recursively the iterates of f by $f^0(x) = x$ for all x (f^0 is the identity map), $f^1 = f$ and $f^i = f \circ f^{i-1}$. The orbit of x is then the set $\{x, f(x), f^2(x), \dots\}$, which is composed of all iterates of x . The orbit is periodic if the cardinality of this set, say k , is finite, and its period is given by k . Equivalently, a periodic orbit or a cycle of f with (primitive) period k is defined by (x_1, \dots, x_k) such that 1) $f^k(x_1) = x_1$ and 2) $f^{i-1}(x_1) = x_i \neq x_1$ for $i = 2, \dots, k$. This implies that all points x_i of the cycle are fixed points of f^k and that they all differ (one says then that x_1 is a periodic point of f with period k).

Of course, if f is arbitrary, there is little hope to get interesting results. The simplifying feature of the theory is to assume that f is unimodal. More precisely, we say that f is unimodal if

- 1) f is continuous
- 2) there exists x^* in (a,b) such that f is increasing on $[a,x^*]$ - i.e., $f(x) > f(x')$ for all x, x' in $[a,x^*]$ such that $x > x'$ - and decreasing on $[x^*,b]$

- 3) $f(x^*) = b$

We shall say that f is C^1 -unimodal if in addition

- 4) f is once continuously differentiable and $f'(x) \neq 0$ when $x \neq x^*$.

Note that when f is unimodal, then f has a unique fixed point \bar{x} in the interval (x^*,b) . Moreover, since f is decreasing on $[x^*,b]$ one has $f(b) < \bar{x} < b$ (see Figure 1.a). Finally, remark that the assumption that f is defined on a closed interval is not as restrictive as it may appear at first sight, since one may often go back to that case. For instance, if f maps the interval $[a,+\infty)$ into itself and is unimodal with a unique maximum at $x^* > a$, with $f(x^*) > x^*$, one may restrict attention without any loss of generality to the behaviour of f on the interval $[a,f(x^*)]$ since $f(x)$ belongs to ^{3/} that interval for any $x \geq a$ (see Figure 1.b).

3. Sarkovskii's Theorem

We remarked earlier that when f is unimodal, it has a unique fixed point \bar{x} in the interval (x^*,b) . This fixed point is thus bound

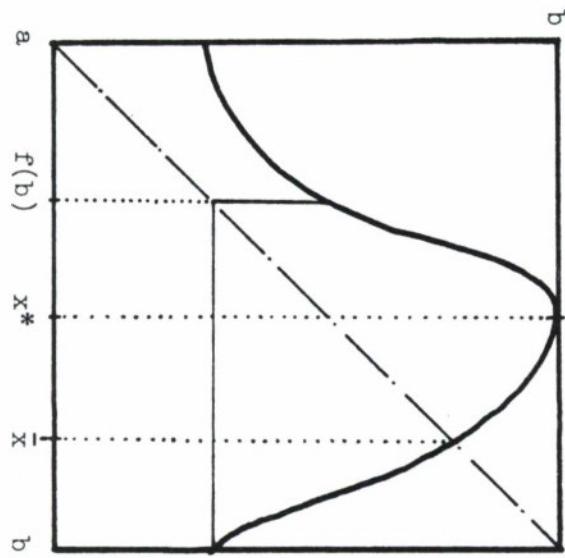


Figure 1.a

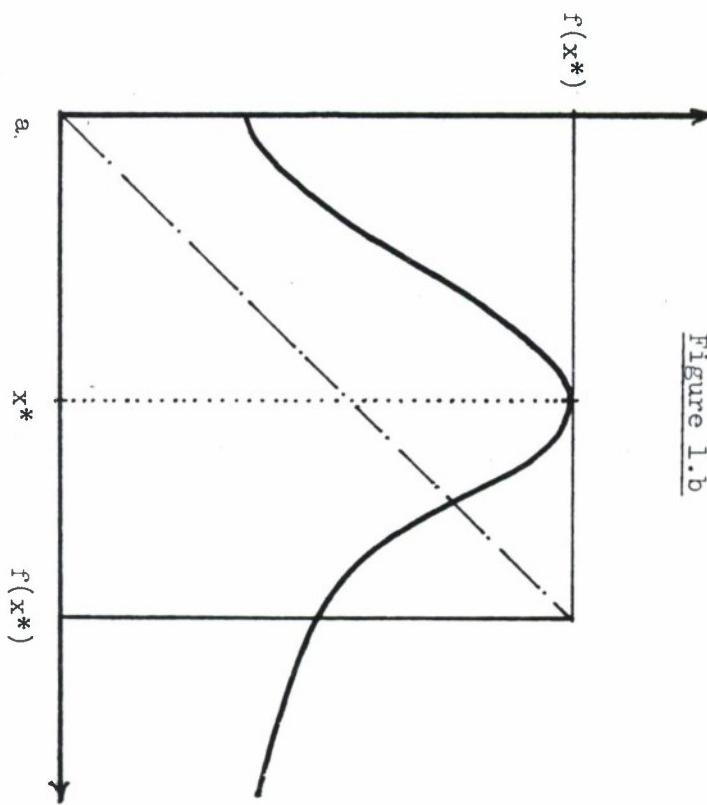


Figure 1.b

to coexist with any other periodic orbit. It turns out that one may get much more information concerning the coexistence of cycles displaying different periods. This is achieved in the following beautiful result, which is due to Sarkovskii [1964] - see also Stefan [1977].

Theorem 1: (Sarkovskii). Consider the ordering of the integers

$$\begin{aligned} & 3 > 5 > 7 \dots \\ & > 2 \cdot 3 > 2 \cdot 5 > 2 \cdot 7 > \dots \\ & \quad \dots \\ & > 2^n \cdot 3 > 2^n \cdot 5 > 2^n \cdot 7 > \dots \\ & \quad \dots \\ & > \dots > 2^m > \dots > 8 > 4 > 2 > 1 . \end{aligned}$$

That is, first the odd integers greater than or equal to 3 forward, then the powers of 2 times these odd integers, and then the powers of 2 backward. If f is unimodal and has a cycle with period k then it has a cycle of period k' for every $k' < k$ in the sense of the above ordering.

Proof: This is (CE, Theorem II.3.10, p. 91).

Q.E.D.

4. Stable Cycle

The preceding theorem implies that a unimodal map may have a lot of different cycles - think of the case in which f has a cycle of period 3. Some (or all) of them may be unstable, however, and thus essentially irrelevant as far as the dynamic behaviour of the system is concerned. It is therefore important to know how many stable cycles - if any - the map f possesses. It is only recently that a real

breakthrough was achieved on this matter by Singer [1978], who discovered that a unimodal map with a negative "Schwarzian derivative" could have at most one stable cycle.^{4/}

Let us first define stability. Given the map f from $[a,b]$ into itself, consider a periodic orbit (x_1, \dots, x_k) . Since x_1 is a fixed point of f^k , we may say that this periodic orbit is (locally) stable if there exists an open neighborhood U of x_1 such that for every x in U , $f^{kt}(x)$ stays in U for all $t \geq 1$ and

$\lim_{t \rightarrow \infty} f^{kt}(x) = x_1$. When f is continuous, this implies that $f^{kt}(f^{i-1}(x))$ converges to x_1 as well for every $i = 2, \dots, k$. If f is continuously differentiable, this means that the derivative of f^k at x_1 has a modulus less than 1, i.e., $|Df^k(x_1)| < 1$. Of course, in order to make any sense, this definition should not depend upon the point chosen on the periodic orbit. As a matter of fact, we have by the chain rule of differentiation

$$\begin{aligned} Df^k(x_1) &= f'(x_k) Df^{k-1}(x_1) = \dots = f'(x_k) \dots f'(x_1) \\ &= Df^k(x_1) \end{aligned}$$

When f is continuously differentiable, we may therefore say that the cycle (x_1, \dots, x_k) is stable if $|Df^k(x_1)| < 1$. The cycle will be said to be weakly stable if $|Df^k(x_1)| \leq 1$ (this definition allows for "onesided" stability only).^{5/} Finally, it will be said to be superstable if $Df^k(x_1) = 0$. When f is C^1 -unimodal, this means that the critical point x^* belongs to the periodic orbit.

We define next the notion of a Schwarzian derivative. Assume that f is thrice continuously differentiable. The Schwarzian derivative of f at x , denoted $Sf(x)$, is defined by

$$Sf(x) = \frac{f'''(x)}{f'(x)} - \frac{3}{2} \left[\frac{f''(x)}{f'(x)} \right]^2$$

whenever $f'(x) \neq 0$. Direct computation shows that

$Sf = -2|f'|^{1/2} D^2[|f'|^{-1/2}]$. So the condition that "f has a negative Schwarzian derivative" ($Sf < 0$ at every x such that $f'(x) \neq 0$) means that $|f'|^{-1/2}$ is convex on every interval of monotony of f . It will be satisfied in particular if $|f'|$ (or $\log |f'|$) is concave on such intervals. But these sufficient conditions are by no means necessary. Finally the reader will note that the concavity of f is neither necessary nor sufficient to guarantee $Sf < 0$. Consider next the following conditions

S1. f is C^1 -unimodal

S2. f is thrice continuously differentiable

S2. $Sf(x) < 0$ for all x in $[a,b]$, $x \neq x^*$.

Then we have

Theorem 2: Assume that f satisfies S1, S2, S3, $f(x) > x$ for all x in (a,x^*) , and $f'(a) > 1$ whenever $f(a) = a$. Then

1) The map f has at most one weakly stable periodic orbit.

This periodic orbit lies in the interval $[f(b), b]$.

2) If f has a weakly stable periodic orbit, it attracts the critical point x^* , that is, it coincides with the set of accumulation points of the sequence $(f^t(x^*))$.

Proof: We may note incidentally that under S1, S2, S3, one has $f(x) > x$ for all x in (a, x^*) whenever $f'(a) > 1$. This follows from the fact that since $Sf < 0$, f' cannot have a positive local minimum on that interval (see Step 3 of the proof of Theorem II.4.1 in CE, p. 97. Indeed, if there existed x in (a, x^*) such that $f(x) \leq x$, then by the mean value theorem there would be y_1, y_2 , with $a < y_1 \leq x \leq y_2 < x^*$ such that $f'(y_1) \leq 1 < f'(y_2)$ and f' would be a positive local minimum in (a, y_2) , a contradiction.

Remark now that when f is unimodal, $f(x) > x$ for all x in (a, x^*) implies that

- (i) f maps the interval $[f(b), b]$ into itself (onto if and only if $f(b) \leq x^*$)
- (ii) for every x in $(a, f(b))$, there exists j such that $f^j(x) \in [f(b), b]$.

This follows from elementary considerations that are left to the reader. This shows that all periodic orbits - with the possible exception of an unstable fixed point of f at $x = a$ - must lie in $[f(b), b]$. In particular, any weakly stable cycle belongs to that interval.

Corollary II.4.2 in CE implies therefore that the statements of Theorem 2 are valid provided that f satisfies the additional condition

S4. f maps $[f(b), b]$ onto itself.

However, a closer look at CE's proof of this Corollary shows that it is still valid if S4 is replaced by the weaker

S4'. f maps the interval $[f(b), b]$ into itself.

But we have seen that this condition was implied by the assumptions of Theorem 2. The proof is complete. Q.E.D.

We shall note for further reference

S4". (i) $f(x) > x$ for all x in (a, x^*)
(ii) $f'(a) > 1$ when $f(a) = a$.

As we have seen, if f is unimodal, then S4" implies S4', while it implies S4 if and only if $f(b) \leq x^*$.

The foregoing result provides an "experimental" way of verifying if a particular map satisfying the conditions of the theorem possesses a weakly stable cycle. It suffices indeed to check if the iterates of the critical point $f^t(x^*)$ converge to some periodic orbit and then to verify that the limit cycle is weakly stable. All these operations can in fact be easily achieved by using modern computers.

Maps that do not posses any weakly stable cycle appear to be good candidates to portray "chaotic" (aperiodic) behaviour in onedimensional dynamical systems. Theorem 2 provides a way to recognize whether or not a particular map is chaotic in the sense. Indeed, if f satisfies S1, S2, S3 and S4", then all cycles of f will be unstable if the iterates

of the critical point $f^t(x^*)$ do not converge or if they converge to an unstable periodic orbit. Again these conditions are easy to verify with the help of modern computers. Of course, since iterations must be stopped after a finite time in practice, this experimental way of proceeding will be unable to distinguish between chaotic behaviour and the presence of a weakly stable cycle that has a long period or that is only weakly attracting.

The next statement provides a condition involving the trajectory of the critical point x^* of f only, that ensures the existence of a (unique) weakly stable cycle. To this effect, we introduce some notation. Given a unimodal map f , for every x in $[a,b]$, the extended itinerary of x describes how the iterates $f^t(x)$ behave qualitatively, i.e., whether or not they fall on the right or on the left of the critical point x^* . More precisely, this extended itinerary $I_E(x)$ is an infinite sequence of R's, of L's and of C's obeying the following rule. If $[I_E(x)]_j$ denotes the j -th element of $I_E(x)$ for $j = 0, 1, \dots$, then $[I_E(x)]_j = R$ if $f^j(x) > x^*$, $[I_E(x)]_j = C$ if $f^j(x) = x^*$, and $[I_E(x)]_j = L$ if $f^j(x) < x^*$. We shall say that $I_E(x)$ is periodic with (primitive) period k if $[I_E(x)]_{j+k} = [I_E(x)]_j$ for all j and if k is the smallest integer having this property.

Proposition 3: Assume that f satisfies S1, S2, S3, S4" and S5. $f''(x^*) < 0$.

Then f has a (unique) weakly stable cycle P if and only if the extended itinerary of the endpoint b , i.e., $I_E(b)$, is periodic. If the

period of $I_E(b)$ is k , the period of P is k or $2k$.

Proof: Assume that $I_E(b)$ has period k . If $f(b) \leq x^*$, then S⁴ is satisfied, and from the "if" part of (CE, Proposition II.6.2), f has a weakly stable cycle in $[f(b), b]$. If $f(b) > x^*$, then $f(b) \leq f^j(x^*)$ for all $j \geq 1$. But it is then easy to verify that the restriction of f to $(f(b), b)$ has a sink in the sense of (CE, p. 107). Therefore from (CE, Lemma II.5.1), f has a weakly stable periodic orbit in $[f(b), b]$ in that case too (one can alternatively prove directly that f^2 has a weakly stable fixed point $[f(b), b]$, see the proof of Proposition 4). In all cases the weakly stable cycle is unique from Theorem 2. Finally, the fact that its period is k or $2k$ is an immediate consequence of (CE, Lemma II.3.2).

Assume conversely that f has a (unique) weakly stable cycle P of period k . It must lie in $[f(b), b]$. We wish to apply the "only if" part of (CE, Proposition II.6.2). A close look at their argument shows that their result is valid if S⁴ is replaced by S^{4'} - and thus under S^{4"} - but that it is correct only when the rightmost point of P , say x , satisfies $x \geq x^*$ - which is the case under S₁, S₂, S₃, S^{4'}, if and only if $k \geq 2$ or when the periodic orbit is a fixed point in (x^*, b) . The "only if" part of (CE, Proposition II.6.2) is not correct however under their assumptions if P is a weakly stable fixed point x of f such that $x < x^*$ (counterexamples are provided by making symmetric the cases 1-4 of Figure II.8 in CE, p. 102).^{6/} The latter circumstance is ruled out however under S^{4"}, so the "only if" part of (CE, Proposition II.6.2) is valid under our assumptions. Thus $I_E(b)$ is periodic, and

from (CE, Lemma II.3.2), its period is k or $k/2$.

Q.E.D.

The concept of (weak) stability that we have used is only local. It is thus important to know how large is the basin of attraction of a given weakly stable cycle. The next result states that under the conditions of Proposition 3, if there exists a weakly stable periodic orbit, which is then unique, the set of points that are not attracted to it is "exceptional."

Proposition 4: Assume that f satisfies S_1, S_2, S_3, S_4'' and S_5 , and that it has a weakly stable cycle P . Let E be the set of points x in $[a,b]$ such that $f^t(x)$ does not tend to P . Then E has Lebesgue measure 0.

Proof: If $f(b) \leq x^*$, S_4 is satisfied. Then from (CE, Proposition II.5.7), the set E_f of points in $[f(b), b]$ that are not attracted to the weakly stable periodic orbit P , has Lebesgue measure 0.^{7/} Let E'_f be the set of points x in $[a, f(b))$ such that $f^t(x) \in E_f$ for some t . Since f is increasing on $[a, x^*)$, the Lebesgue measure of E'_f is also 0. The set of points of $[a, b]$ that are not attracted to P is $E_f \cup E'_f$, to which one must add the endpoint a whenever $f(a) = a$, which shows the result in that case.

The case in which $x^* < f(b)$ is even simpler. The unique weakly stable cycle P belongs to $[f(b), b]$. Moreover, the iterates of any point x of $A = [x^*, b]$ lie in A , and oscillate around the unique fixed point \bar{x} of f that belongs to A (whenever $x \neq \bar{x}$). In

particular, $I_E(b) = R^\infty$ and thus from Proposition 3, the period of P is 1 or 2. It is clear that $Df^2(x^*) = 0$ and $Df^2(x) > 0$ for all x in A , $x \neq x^*$. Furthermore, f^2 has a negative Schwarzian derivative on $(x^*, b]$ and has finitely many fixed point in $[x^*, b]$ - see steps 2 and 4 of the proof of Theorem II.4.1 in CE, pp. 97-98. Consider first the case in which the period of P is 1. Then since $f^2(x^*) = f(b) > x^*$, $f^2(b) < b$ and $Df^2(\bar{x}) \leq 1$, one must have $f^2(x) > x$ for all x in $[x^*, \bar{x})$ and $f^2(x) < x$ for all x in $(\bar{x}, b]$, otherwise there would be another weakly stable periodic orbit (of period 2). Thus $f^{2j}(x)$, and thus $f^j(x)$, converges to \bar{x} as j tends to $+\infty$ for all x in $[x^*, b]$, see Figure 2.a. The other case in which the period of P is 2 is dealt with similarly. Let x_1 and x_2 be the two points of P . They satisfy $x^* < x_1 < \bar{x} < x_2 < b$. From the uniqueness of the weakly stable cycle, we have $Df^2(\bar{x}) > 1$ and in fact $f^2(x) > x$ for all x in (x^*, x_1) or (\bar{x}, x_2) , and $f^2(x) < x$ for every x in (x_1, \bar{x}) or (x_2, b) , see Figure 2.b. Thus $f^{2j}(x)$, and thus $f^j(x)$, converges to P as j tends to $+\infty$ for all x in $[x^*, b]$ except $x = \bar{x}$.

Thus if the period of P is 1, it attracts the whole interval $[a, b]$, except a if $f(a) = a$. If the period of P is 2, it attracts again the whole interval $[a, b]$, with the exception of the preimages of \bar{x} , i.e., of all points x of $[a, x^*)$ such that $f^j(x) = \bar{x}$ for some j , and of the endpoint a when $f(a) = a$. In the two cases, the exceptional set is finite or countable, which completes the proof. Q.E.D.

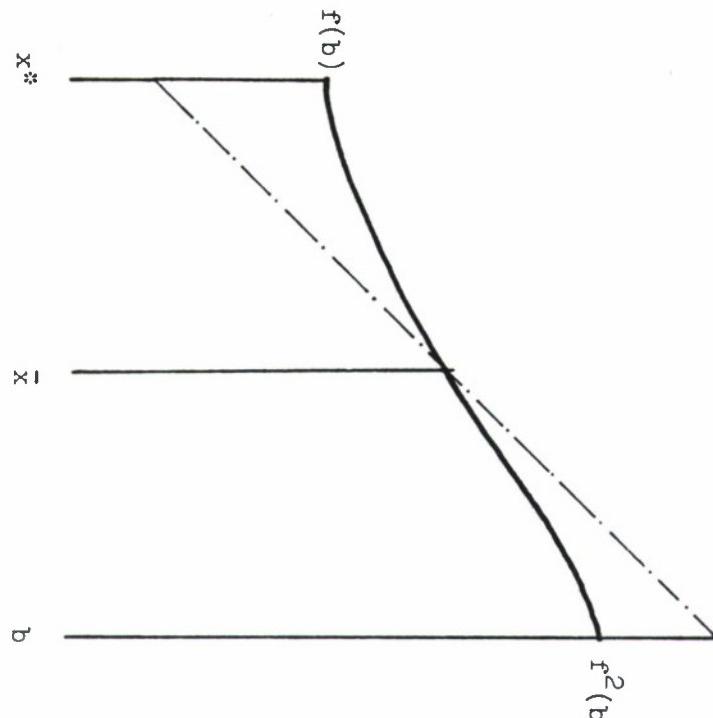


Figure 2.a

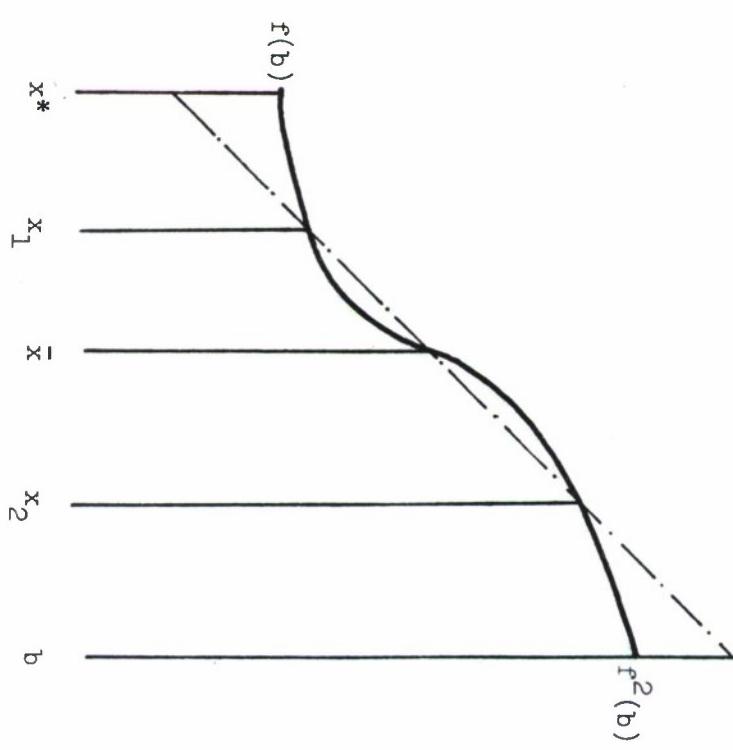


Figure 2.b

Remark: Proposition 4 shows that some claims according to which "period 3 implies chaos" are not always warranted. For instance, a consequence of the results of Li and Yorke [1975] is that if f is unimodal and if there exists a cycle of period 3, then there is an uncountable set S in $[a,b]$ and an $\epsilon > 0$ such that for every x and y in S

$$\limsup_{j \rightarrow \infty} |f^j(x) - f^j(y)| \geq \epsilon$$

and

$$\liminf_{j \rightarrow \infty} |f^j(x) - f^j(y)| = 0$$

Thus trajectories with initial points in S - which may be called the "chaotic" set - come arbitrarily close and then noticeably separated infinitely often.

Some theorists have used this result (or a variant of it) to claim that the existence of a cycle of period 3 was an indication of chaotic behaviour (see in particular in economics Benhabib and Day [1981, 1982], Day [1982, 1983]). Proposition 4 shows that such a claim is unwarranted, for if there is a stable cycle, then the "chaotic" set S may be of Lebesgue measure 0 (think of a Cantor set) and thus essentially unobservable.

A more appropriate definition of chaos or aperiodicity is as we have seen, the property that all cycles are unstable.

5. Aperiodic Dynamics

As we said, maps f that have no weakly stable cycles appear to be good candidates to describe turbulent or "chaotic" behavior in one-dimensional dynamical systems. There is an obvious reason to look at such maps from that viewpoint. For if one considers a map f on $[a,b]$ that satisfies Assumptions S1, S2, S3, and if it has no weakly stable cycle, then for "most" initial points x the iterates of x , $f^j(x)$, will not display any periodic behaviour even if we wait long enough. Indeed under these assumptions, we know that f^k has only finitely many fixed points in $[a,b]$ (see steps 2 and 4 of the proof of Theorem II.4.1 in CE, pp. 97-98). Thus f has at most a countable number of cycles.^{8/} This implies that if E is the set of all points in $[a,b]$ that belong to a periodic orbit of f , E has Lebesgue measure 0, and that the orbit of any point x not in E is aperiodic, even if one iterates it long enough.

Among the class of such aperiodic maps, of special interest are those which possess a unique invariant probability measure which is absolutely continuous with respect to the Lebesgue measure, and which is ergodic. The probability measure ν on $[a,b]$ (endowed with its Borel σ -algebra) is said to be invariant with respect to f if $\nu(f^{-1}(A)) = \nu(A)$ for any Borel set. It is absolutely continuous with respect to the Lebesgue measure λ (absolutely continuous for short) if for any Borel set A , $\lambda(A) = 0$ implies $\nu(A) = 0$ (ν has then a λ -integrable density with respect to λ). Finally, ν is said to be ergodic if for any ν -integrable real-valued function g ,

$$\frac{1}{n} \sum_{j=1}^n g(f^{j-1}(x)) + \int g d\nu$$

as n tends to $+\infty$, for ν -almost every x . This implies in particular that if one considers for each x and every n , the empirical distribution $v_n(x)$ that is generated by the iterates $f^j(x)$ for $j = 0, \dots, n-1$, which assigns probability $1/n$ to each $f^j(x)$, then the sequence $v_n(x)$ converges weakly to ν for ν -almost every x .^{9/} Thus if ν is absolutely continuous and ergodic, although a given trajectory may look somewhat erratic since the iterates fill up eventually the support of the limit distribution ν , empirical distributions and time averages become ultimately fairly stable for ν -almost every initial point.

The next result gives a sufficient condition for the existence of a unique absolutely continuous invariant measure, which is ergodic.

Theorem 5: assume that f satisfies S1, S2, S3, S5, that is has no weakly stable periodic orbit, and that there exists an open neighbourhood V of x^* such that $f^j(x^*) \notin V$ for $j \geq 1$. Then f has a unique absolutely continuous invariant probability measure. It is ergodic.

Proof: Note first that if all cycles of f are unstable, S1, S2, S3 imply S4'', otherwise f would have a weakly stable fixed point in $[a, x^*]$. Second, one must have $f(b) \leq x^*$, so that S4 is satisfied, otherwise f would have a weakly stable cycle in $[x^*, b]$. Thus we may apply (CE, Theorem III.8.3). Q.E.D.

Corollary 6: If f satisfies S1, S2, S3, S4", S5 and if the iterates

$f^j(x^*)$ of the critical point converge to an unstable cycle, then f has a unique absolutely continuous invariant probability measure. It is ergodic.

Proof: In view of Theorem 2, f has no weakly stable cycle and the iterates of x^* stay at a finite distance of x^* . Thus Theorem 5 applies. Q.E.D.

Remark: the foregoing results go in the direction of showing that aperiodic maps (having only unstable cycles) may display strong statistical regularities after all. Another direction of research has been to show that some (but not all) aperiodic maps may generate trajectories that are very sensitive to a small variation of initial conditions, thereby exhibiting the kind of phenomena that are observed e.g. in turbulent flows (maps that have a unique weakly stable periodic orbit as in Theorem 2 do not have such a sensitivity to initial conditions). For an aperiodic and sensitive map, a small error of measurement of the initial state, for instance, may result in very large prediction errors (relatively speaking) for future dates, even if the forecaster knows very well the law of motion of the system (the map f). For various definitions of sensitivity and a discussion of their implications, see (CE, pp. 15-22, 30-35, and Section II.7).

6. Topological Conjugacy

There is nothing intrinsic in the representation of a one-dimensional dynamical system by a particular difference equation $x_{t+1} = f(x_t)$, since one can always make a change of coordinates. We investigate now what happens when one makes a change of variable $y = h(x)$, in which h maps $[a,b]$ onto $[a',b']$, is once continuously differentiable, and $h'(x) > 0$ for all x in $[a,b]$. With the new variable, the dynamical system is represented by a new function g which maps $[a',b']$ into itself and satisfies $g(y) = h[f(h^{-1}(y))]$. Thus $g = h \circ f \circ h^{-1}$, we say then that f and g are topological conjugates.^{10/}

The maps f and g describe the same dynamics since the iterates of f and g are linked by $g^j = h f^j h^{-1}$ for all $j \geq 0$. In particular (x_1, \dots, x_k) is a cycle of f if and only if $(h(x_1), \dots, h(x_k))$ is a cycle of g . By differentiation one gets for all x

$$Dg^k(h(x))h'(x) = h'(f^k(x))Df^k(x)$$

and thus $Dg^k(h(x_1)) = Df^k(x_1)$ at any point of the periodic orbit.

Stability or instability of a periodic orbit is topologically invariant.

It is now immediate that S1 is topologically invariant, in the sense that f satisfies this condition if and only if g does. The same is true of S2 if h is thrice continuously differentiable. Conditions like $f(x) > x$ are also topologically invariant, as well as S4, S4' or S4''. Finally, it is easily seen that the condition

$f''(x^*) < 0$ is unchanged through the change of variable provided one assumes h to be twice continuously differentiable. Differentiating $g(h(x)) \equiv h(f(x))$ twice and evaluating the expressions at $x = x^*$ yields indeed

$$g''(h(x^*))[h'(x^*)]^2 = f''(x^*)h'(f(x^*))$$

if one takes into account the fact that $g'(h(x^*)) = f'(x^*) = 0$.

However, the condition S3 - which says in effect that $D^2|f'(x)|^{-1/2}$ is positive for all x in $[a,b]$, $x \neq x^*$ - is not generally invariant (like any convexity statement) through a (nonlinear) change of variable. The point of this discussion is that even when a particular map f does not satisfies S3, the foregoing results, i.e., Theorem 2 through Corollary 6, are still valid provided that one of the topological conjugates g of the original map f satisfies the assumptions made in anyone of these statements.

7. Bifurcations: Period Doubling and the Transition to Turbulance

Numerical experimentation with onedimensional nonlinear dynamical systems yields remarkable regularities that do not appear to depend much upon the maps under consideration. More precisely, consider a family of onedimensional unimodal maps f_λ that depend upon some real number λ , that may be thought as indexing one of the characteristics of the system (the parameter may be for instance under the control of some outside observer in a physical experiment). If we look back at Theorem 1, we should expect that the fashion in which cycles appear when λ is

varying, should display some degree of conformity with Sarkovskii's ordering of the integers. Namely, we should expect cycles having a period that is a power of 2 to appear first. Numerical experimentation shows that this is indeed the case. In fact, this is true for (weakly) stable cycles.

Let us assume that for each λ , we iterate the critical point x_λ^* of f_λ on a computer. If each f_λ satisfies the conditions of Theorem 2 and has in particular a negative Schwarzian derivative, we know that this procedure permits discovering (weakly) stable cycles that have a small period and that are attracting enough. Suppose now that we put λ on an horizontal axis and that above each value of λ we plot vertically the values taken by the iterates $f_\lambda^t(x_\lambda^*)$ for, say, $t = 200$ to 300. Computer simulations of this type yield typically a very neat "bifurcation diagram" which displays first a whole interval in which period doubling bifurcations occur more and more rapidly, a stable fixed point giving rise to a stable cycle of period 2, which yields then a stable cycle of period 4 and so on. The values of λ for which such period doubling bifurcations occur tend to some limit value λ_∞^* , beyond which one enters the "chaotic" region for $\lambda > \lambda_\infty^*$, one often observes a "mess" - meaning that one has either an aperiodic ("chaotic") map or a stable cycle with a very long period - in the middle of which windows may appear that show stable cycles with low periods like 3, 5, 6 or 7 (that depends of course of the degree of resolution of the diagram).^{11/}

The results that follow explain why such an outcome should be typically observed. Formally, we consider a one-parameter family of

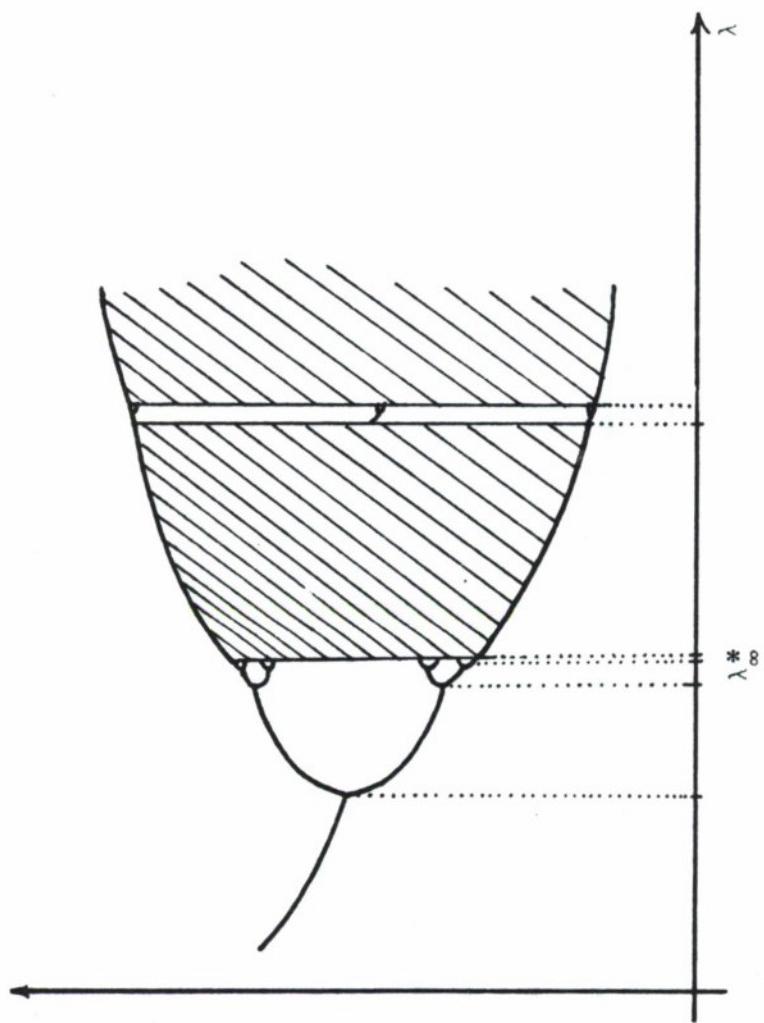


Figure 3

maps f_λ in which λ belongs to $[0,1]$. For each λ in that interval, f_λ maps the interval $[a_\lambda, b_\lambda]$ into itself, is C^1 -unimodal with a unique critical point x_λ^* in (a_λ, b_λ) and $f_\lambda(x_\lambda^*) = b_\lambda$. We assume that a_λ and b_λ depend continuously on λ , as well as f_λ and its derivatives. More precisely, for any sequence λ_n that tends to λ in $[0,1]$, then $a_n = a_{\lambda_n}$ and $b_n = b_{\lambda_n}$ tend to a_λ and b_λ respectively, while for any sequence $x_n \in [a_n, b_n]$ that converges to $x \in [a_\lambda, b_\lambda]$, the sequences $f_{\lambda_n}(x_n)$ and $f'_{\lambda_n}(x_n)$ converge to $f_\lambda(x)$ and $f'_\lambda(x)$, respectively.

We shall say that the family if full if

1. for $\lambda = 0$, one has $f_0(b_0) > x_0^*$. In that case, as one can easily verify, all iterates $f_0^j(x_0^*) = f_0^{j-1}(b_0)$ belong to the interval $[f_0(b_0), b_0]$ for $j \geq 1$.
2. for $\lambda = 1$, one has $f_1^2(x_1^*) < x_1^*$ and $f_1^3(x_1^*) < x_1^*$.

Then we have

Theorem 7: Consider a full one-parameter family of C^1 -unimodal maps indexed by λ in $[0,1]$. Then

1) Given an arbitrary $k \geq 2$, the set of parameters λ for which the map f_λ has a superstable cycle of period k is closed and nonempty. Given such a λ , there is an open interval around λ such that $f_{\lambda'}$ has a stable cycle of period k for all λ' in this interval.

2) Let λ_j^* be the first value of the parameter λ for which a superstable cycle of period 2^j obtains for $j \geq 1$. Then the sequence λ_j^* increases with j and converges to some value $\lambda_\infty^* < 1$ as j tends

to $+\infty$. For each λ in $[0, \lambda_\infty^*]$, all cycles of the map f_λ have a period that is a power of 2 or are fixed points. The critical point x_λ^* of f_λ is attracted to one of these.

3) If superstable cycles of periods 2^j and $2^{j'}$ with $j' > j + 1$ occur respectively for the values λ and λ' in $[0, \lambda_\infty^*]$, then a superstable cycle of period 2^i with $j' > i > j$ must appear for some value in the open interval determined by λ and λ' .

Proof: As a preliminary remark, CE require that $a_\lambda = -1$, $b_\lambda = 1$, $x_\lambda^* = 0$ for all λ , but the proofs of the results we shall use, employ only simple continuity arguments that do not depend upon these specific assumptions. Second, our assumptions imply that the itinerary of b_0 , denoted $K(f_0)$, is R^∞ , while that of b_1 , denoted $K(f_1)$ starts RLL ... (itineraries are defined in CE, p. 64)

1) According to (CE, Theorem III.1.1), every maximal admissible sequence A satisfying $K(f_0) < A < K(f_1)$ occurs as the itinerary $K(f_\lambda)$ of b_λ for some λ in $(0, 1)$ (admissible sequences are defined in CE, p. 64, the ordering between admissible sequences is defined in CE, p. 65–66, while maximal sequences are defined in CE, p. 71). In fact, it follows from the proof of this theorem (see CE, p. 175) that the set of such λ 's is nonempty and closed provided that $A \neq (BR)^\infty$ and $A \neq (BL)^\infty$.

Choose now an integer $k \geq 2$, and consider a maximal sequence BC in which the sequence B contains $k - 1$ elements, such that

$$R^\infty < BC < RLLL \dots$$

Given k , the set of such sequences is necessarily finite. It is not difficult to verify that is nonempty. As a matter of fact, we have

Lemma 8: One has^{12/}

$$RLL \dots > \dots > RLR^{i-3} C > (RLR^{i-2})^\infty > RLR^{i-1} C > \dots$$

$$> \dots > R^* RLR^{i-3} C > R^*(RLR^{i-2})^\infty > R^* RLR^{i-1} C > \dots$$

$$> \dots > R^{*n} RLR^{i-3} C > R^{*n} (RLR^{i-2})^\infty > R^{*n} RLR^{i-1} C > \dots$$

$$> \dots > R^{*(m+1)} * RC > R^{*(m+1)} * R^\infty > R^m * RC > \dots > RC > R^\infty$$

in which $i \geq 3$ is odd, $n \geq 1$ and $m \geq 1$ are arbitrary.

Proof: If one ignores the finite sequences in this series of inequalities, what has been written is simply the translation of (CE, Theorems II.2.8 and II.2.9). What we have done is just to insert these finite sequences. Now the first line of inequalities and the fact that the first sequence appearing on the second line satisfies

$$R^* RLC = RLRRRC < RLR^{i-3} C$$

for every odd integer $i \geq 3$ is readily verified by inspection. Then all the lines of inequalities except the last one follow by induction from the fact that R^* is monotone among the set of maximal itineraries (see CE, Theorem II.2.5). The last line is in fact (CE, Lemma II.2.12) combined with their Theorems II.2.8 and II.2.9. Q.E.D.

Thus given the integer $k \geq 2$, the set of maximal sequences BC in

which the sequence BC contains $(k - 1)$ elements, and such that

$$R^\infty < BC < RLL \dots$$

is nonempty and finite (it is nonempty since one may take

$BC = R^{*n} * RLR^{i-3} C$ if $k = 2^n \cdot i$ with $n \geq 0$ and $i \geq 3$, i odd, and
 $BC = R^{*m} * RC$ if $k = 2^{m+1}$ with $m \geq 0$). Therefore the set of values
of λ such that the itinerary $K(f_\lambda)$ of b_λ coincides with one such
BC is closed and nonempty. To show the first part of 1), it suffices to
remark that for any λ , the itinerary $K(f_\lambda)$ of b_λ is maximal (see
CE, p. 71) and that f_λ has a superstable cycle of period k if and
only if $K(f_\lambda)$ coincides with one of the BC mentioned above. The last
of 1) is a straightforward continuity argument that is left to the
reader.

2) Lemma II.2.2 in CE states that the sequences appearing in the
last line of inequalities in Lemma 8 above are consecutive among the
maximal sequences ("consecutive" is defined in the statement of Lemma
II.2.2 in CE). It follows then from (CE, theorem III.1.1) that the
itinerary $K(f_{\lambda_j^*})$ of $b_{\lambda_j^*}$ is $R^{*(j-1)} * RC$, and that $\lambda_i^* > \lambda_j^* > 0$
whenever $i > j$ (otherwise λ_j^* would not be the minimum value of λ
for which a superstable cycle of period 2^j obtains). The sequence
 λ_j^* converges thus towards $\lambda_\infty^* \leq 1$. By another application of Lemma
II.2.2 and Theorem III.1.1 in CE, one gets that for any λ in $[0, \lambda_\infty^*]$,
the itinerary $K(f_\lambda)$ of b_λ is one of the sequences appearing in the
last line of inequalities in Lemma 8 above. Since there are values of
 λ in $[0, 1]$ such that f_λ has a superstable cycle with a period that

differs from a power of 2, one must have $\lambda_{\infty}^* < 1$. Next remark that the sequences appearing in the last line of inequalities in Lemma 8 are periodic with a period that is a power of two (see CE, Remark 1, p. 79). Thus for any λ in $[0, \lambda_{\infty}^*)$, the critical point x_{λ}^* is attracted to a periodic orbit the period of which is a power of 2 (see Lemmas II.3.1 and II.3.2 in CE). If the map f_{λ} has another cycle, then the itinerary $I(x)$ of the rightmost point x of the periodic orbit is maximal (see CE, p. 71) and satisfies $I(x) \leq K(f_{\lambda})$ (see CE, Lemma II.1.3). Again from CE, Lemma II.2.2, this itinerary $I(x)$ is one of the sequences appearing in the last line of inequalities of Lemma 8 that are less than or equal to $K(f_{\lambda})$, or it is the sequence L^{∞} (see Lemma II.2.1 in CE). This periodic orbit has a period that is a power of 2 or is a fixed point of f_{λ} .

3) This statement follows again from the fact that the sequences appearing in the last line of inequalities in Lemma 8 are consecutive among the maximal sequences, and from (CE, Theorem III.1.1). Q.E.D.

Theorem 9: Consider a full one-parameter family of C^1 -unimodal maps indexed by λ in $[0,1]$, and assume that for each λ , the map f_{λ} (or one of its topological conjugates g_{λ}) satisfies S1, S2, S3, S4" and S5. Then

- 1) for any λ in $[0, \lambda_{\infty}^*)$, the map f_{λ} has a (unique) weakly stable periodic orbit
- 2) there is an uncountable set of values of λ in $(\lambda_{\infty}^*, 1]$ for which f_{λ} has no weakly stable periodic orbit.

Proof:

1) We have seen when proving 2) of Theorem 7, that for any λ in $[0, \lambda_\infty^*)$, the itinerary $K(f_\lambda)$ of b_λ was one of the sequences that appeared in the last line of inequalities of Lemma 8. Since any one of these sequences is periodic, the result follows from Proposition 3.

2) By the argument of CE, pp. 184-85, there is an uncountable set of values of λ for which the extended itinerary of b_λ is not periodic. By Proposition 3, for each such λ , f_λ has no weakly stable cycle. From 1), all these values of λ must belong to $(\lambda_\infty^*, 1]$. Q.E.D.

Remarks:

1. Under the assumptions of Theorem 9, it can be shown that there is an uncountable set of values of λ in $(\lambda_\infty^*, 1]$ for f_λ has sensitivity to initial conditions, see (CE, Proposition III.2.1).

2. A good deal of recent research aimed at showing that the set of values of λ for which f_λ has no weakly stable cycle (has sensitivity to initial conditions) (has an absolutely continuous invariant probability measure) has positive Lebesque measure. For more information, see CE, Section I.5 and III.2.

3. For practically all families for which bifurcation diagrams have been computed, one observes striking numerical regularities. For instance, if λ_j is the value for which there is a bifurcation from a cycle of period 2^j to a period 2^{j+1} , then $(\lambda_j - \lambda_{j-1})/(\lambda_{j+1} - \lambda_j)$ tends very rapidly, as j diverges to $+\infty$, to some number $\delta = 4.66920 \dots$, that seems independent of the family f_λ under consideration. For a discussion of this and related points, and a

theorem that gives a partial mathematical explanation of this "empirical" phenomenon, see CE, Sections I.6 and III.3. For an extension to families of maps on $\mathbb{R}^{\underline{m}}$, with $m \geq 2$, see CE, Section III.4.

Footnotes

- 1/ For applications to economics, see the references cited above. For an excellent review of the applications in other fields, see May [1976].
- 2/ Another, more recent review which presents essentially the same facts but from a slightly different point of view is provided by J. Guckenheimer and P. Holmes [1983].
- 3/ CE requires that $a = -1$, $x^* = 0$, $b = 1$. However, none of their arguments depend upon that specification and they are valid for the case at hand. We shall use that fact repeatedly without any further explicit reference.
- 4/ Singer's result is actually more general, since he showed that the number of stable cycles of an arbitrary map with a negative Schwarzian derivative is bounded above by the number of its critical points.
- 5/ CE use "stable" to denote what we call "weakly stable."
- 6/ These facts have been confirmed to me privately by Pierre Collet.
- 7/ To be precise, Proposition II.5.7 in CE is correct under assumptions S1, S2, S3, S4, S5 provided that $f(b)$ is not a fixed point of f satisfying $f'(f(b)) = 1$ (this fact has also been confirmed to me privately by Pierre Collet). This circumstance is however ruled out by S4". We may therefore apply their Proposition II.5.7 when $f(b) \leq x^*$.
- 8/ This property is generic, i.e., it holds on a Baire set (a countable intersection of open and dense sets) in the space of once differentiable maps with the C^1 -topology, if one discards the assumption that f has a negative Schwarzian derivative.
- 9/ See, e.g. Parthasarathy ([1967], Theorem 9.1). That book contains also the definition of the weak convergence of probability measures.
- 10/ The general definition of topological conjugacy requires only that h is an increasing homeomorphism (h is onto, continuous, increasing and h^{-1} is continuous also). The discussion that follows is in fact valid in this general case, we stick nevertheless to the differentiable case to simplify the presentation.

- 11/ Diagrams of this type are numerous in the literature. See CE, p. 26, May [1976]. Such bifurcation diagrams have been obtained in economic models by Dana and Malgrange [1981], Grandmont [1983], Jensen and Urban [1982].
- 12/ The product A^*B is defined in CE, p. 72, the notation A^{*n} is introduced in CE, p. 76.

References

- Benhabib, J. and R.H. Day [1981], "Rational Choice and Erratic Behaviour," Review of Economic Studies, 48, pp. 459-472.
- Benhabib, J. and R.H. Day [1982], "A Characterisation of Erratic Dynamics in the Overlapping Generations Model," Journal of Economic Dynamics and Control, 4, pp. 37-55.
- Collet, P. and J.-P. Eckmann [1980], Iterated Maps on the Interval as Dynamical Systems, Birkhauser, Boston.
- Dana, R.A. and P. Malgrange [1981], "The Dynamics of a Discrete Version of a Growth Cycle Model," CEPREMAP Working Paper, forthcoming in Analysing the Structure of Econometric Models, J.P. Ancot (Ed.), M. Nijhoff, Amsterdam.
- Day, R.H. [1982], "Irregular Growth Cycles," American Economic Review, 72, pp. 406-414.
- Day, R.H. [1983], "The Emergence of Chaos from Classical Economic Growth," Quarterly Journal of Economics, 98, pp. 201-13.
- Grandmont, J.M. [1983], "On Endogenous Competitive Business Cycles," CEPREMAP DP No. 8316. Also available as a IMSSS Technical Report, Economics, Stanford University, and a EHEC Technical Report, Economics, University of Lausanne.
- Guckenheimer, J. and P. Holmes [1983], Nonlinear Oscillations, Dynamical Systems, and Bifurcations of Vector Fields, Applied Math. Sciences Series No. 42, Springer.
- Jensen, R.U. and R. Urban [1982], "Chaotic Price Behaviour in a Nonlinear Cobweb Model," Yale University, mimeo.
- Li, T. and J.A. Yorke [1975], "Period Three Implies Chaos," American Mathematical Monthly, 82, pp. 985-992.
- May, R.B. [1976], "Simple Mathematical Models with Very Complicated Dynamics," Nature, 261, pp. 459-467.
- Parthasarathy, K.R. [1967], Probability Measures on Metric Spaces, Academic Press, New York.
- Rand, D. [1978], "Exotic Phenomena in Games and Duopoly Models," Journal of Mathematical Economics, 5, pp. 173-184.
- Sarkovskii, A.N. [1964], "Coexistence of Cycles of a Continuous Map of the Line Into Itself," Urk. Mat. Z., 16, pp. 61-71.

Singer, D. [1978], "Stable Orbits and Bifurcations of Maps of the Interval," SIAM Journal of Applied Mathematics, 35, p. 260.

Stefan, P. [1977], "A Theorem of Sarkovskii on the Existence of Periodic Orbits of Continuous Endomorphisms of the Real Line," Comm. Math. Phys., 54, pp. 237-248.

REPORTS IN THIS SERIES

160. "The Structure and Stability of Competitive Dynamical Systems," by David Casas and Karl Shell.
161. "Monopolistic Competition and the Capital Market," by J. E. Stiglitz.
162. "The Corporation Tax," by J. E. Stiglitz.
163. "Measuring Returns to Scale in the Aggregate and the Scale Effect of Public Goods," by David A. Starrett.
164. "Monopoly, Quality, and Regulation," by Michael Spence.
165. "A Note on the Budget Constraint in a Model of Borrowing," by Duncan K. Foley and Martin F. Hellwig.
166. "Incentives, Risk, and Information: Notes Towards a Theory of Hierachy," by Joseph E. Stiglitz.
167. "Asymptotic Expansions of the Distributions of Estimates in Simultaneous Equations for Alternative Parameter Sequences," by T. W. Anderson.
168. "Estimation of Linear Functional Relationships: Approximate Distributions and Connections with Simultaneous Equations in Econometrics," by T. W. Anderson.
169. "Monopoly and the Rate of Extraction of Exhaustible Resources," by Joseph E. Stiglitz.
170. "Equilibrium in Competitive Insurance Markets: An Essay on the Economics of Imperfect Information," by Michael Rothschild and Joseph Stiglitz.
171. "Strong Consistency of Least Squares Estimates in Normal Linear Regression," by T. W. Anderson and John B. Taylor.
172. "Incentive Schemes under Differential Information Structures: An Application to Trade Policy," by Partha Dasgupta and Joseph Stiglitz.
173. "The Incidence and Efficiency Effects of Taxes on Income from Capital," by John B. Shoven.
174. "Distribution of a Maximum Likelihood Estimate of a Slope Coefficient: The LIML Estimate for Known Covariance Matrix," by T. W. Anderson and Takamitsu Sawa.
175. "A Comment on the Test of Overidentifying Restrictions," by Joseph B. Kadane and T. W. Anderson.
176. "An Asymptotic Expansion of the Distribution of the Maximum Likelihood Estimate of the Slope Coefficient in a Linear Functional Relationship," by T. W. Anderson.
177. "Some Experimental Results on the Statistical Properties of Least Squares Estimates in Control Problems," by T. W. Anderson and John B. Taylor.
178. "A Note on 'Fulfilled Expectations' Equilibrium," by David M. Kreps.
179. "Uncertainty and the Rate of Extraction under Alternative Institutional Arrangements," by Partha Dasgupta and Joseph E. Stiglitz.
180. "Budget Displacement Effects of Inflationary Finance," by Duncan K. Foley.
181. "Towards a Marxist Theory of Money," by Duncan K. Foley.
182. "The Existence of Futures Markets, Noisy Rational Expectations and Informational Externalities," by Sanford Grossman.
183. "On the Efficiency of Competitive Stock Markets where Traders have Diverse Information," by Sanford Grossman.
184. "A Building Model of Perfect Competition," by Robert Wilson.
185. "A Bayesian Approach to the Production of Information and Learning by Doing," by Sanford J. Grossman, Richard E. Kihlstrom and Leonard J. Mirman.
186. "Disequilibrium Allocations and Recontracting," by Jean-Michel Grandmont, Guy Laroque and Yves Younes.
187. "Agreeing to Disagree," by Robert J. Aumann.
188. "The Maximum Likelihood and the Nonlinear Three Stage Least Squares Estimator in the General Nonlinear Simultaneous Equation Model," by Takeshi Amemiya.
189. "The Modified Second Round Estimator in the General Qualitative Response Model," by Takeshi Amemiya.
190. "Some Theorems in the Linear Probability Model," by Takeshi Amemiya.
191. "The Bilateral Complementarity Problem and Competitive Equilibrium of Linear Economic Models," by Robert Wilson.
192. "Noncooperative Equilibrium Concepts for Oligopoly Theory," by L. A. Gerard-Varet.
193. "Inflation and Costs of Price Adjustment," by Eytan Sheshinski and Yoram Weiss.
194. "Power and Taxes in a Multi-Commodity Economy," by R. J. Aumann and M. Kurz.
195. "Distortion of Preferences, Income Distribution and the Case for a Linear Income Tax," by Mordecai Kurz.
196. "Search Strategies for Nonenvelopable Resource Deposits," by Richard J. Gilbert.
197. "Demand for Fixed Factors: Inflation and Adjustment Costs," by Eytan Sheshinski and Yoram Weiss.
198. "Bargains and Ripoffs: A Model of Monopolistically Competitive Price Dispersion," by Steve Salop and Joseph Stiglitz.
199. "The Design of Tax Structure: Direct Versus Indirect Taxation by A. B. Atkinson and J. E. Stiglitz.
200. "Market Allocations of Location Choice in a Model with Free Mobility," by David Starrett.
201. "Efficiency in the Optimum Supply of Public Goods," by Lawrence J. Lau, Eytan Sheshinski and Joseph E. Stiglitz.
202. "Risk Sharing, Sharecropping and Uncertain Labor Markets," by Frank Hahn.
203. "On Non-Walrasian Equilibrium," by Frank Hahn.
204. "A Note on Elasticity of Substitution Functions," by Lawrence J. Lau.
205. "Quantity Constraints as Substitutes for Inoperable Markets: The Case of the Credit Markets," by Robert D. Willig.
206. "Incentive Consumer's Surplus and Hedonic Price Adjustment," by Robert D. Willig.
207. "Optimal Depletion of an Uncertain Stock," by Richard Gilbert.
208. "Some Minimum Chi-Square Estimators and Comparisons of Normal and LogisticaModels in Qualitative Response Analysis," by Kuniyo Morimune.
209. "A Characterization of the Optimality of Equilibrium in Incomplete Markets," by Sanford J. Grossman.
162. "Inflation and Taxes in a Growing Economy with Debt and Equity Finance," by M. Feldstein, J. Green and E. Shehshinski.
210. "The Specification and Estimation of a Multivariate Logit Model," by Takeshi Amemiya.
211. "Prices and Queues as Screening Devices in Competitive Markets," by Joseph E. Stiglitz.
212. "Conditions for Strong Consistency of Least Squares Estimates in Linear Models," by T. W. Anderson and John B. Taylor.
213. "Utilitarianism and Horizontal Equity: The Case for Random Taxation," by Joseph E. Stiglitz.
214. "Simple Formulae for Optimal Income Taxation and the Measurement of Inequality," by Joseph E. Stiglitz.
215. "Temporal Resolution of Uncertainty and Dynamic Choice Behavior," by David M. Kreps and Evan L. Porteus.
216. "The Estimation of Nonlinear Labor Supply Functions with Taxes from a Truncated Sample," by Michael Hirsh.
217. "The Welfare Implications of the Unemployment Rate," by Michael Hirsh.
218. "Keynesian Economics and General Equilibrium Theory: Reflections on Some Current Debates," by Frank Hahn.
219. "The Core of an Exchange Economy with Differential Information," by Robert Wilson.
220. "A Competitive Model of Exchange," by Robert Wilson.
221. "Intermediate Preferences and the Majority Rule," by Jean-Michel Grandmont.
222. "The Fixed Price Equilibrium: Some Results in Local Comparative States," by Guy Laroque.
223. "On Stockholder Unanimity in Making Production and Financial Decisions," by Sanford J. Grossman and Joseph E. Stiglitz.
224. "Selection of Regressors," by Takeshi Amemiya.
225. "A Note on A Random Coefficients Model," by Takeshi Amemiya.
226. "An Asymptotic Expansion of the Maximum Likelihood Estimate of the Slope Coefficient in a Heteroscedastic Model," by Takeshi Amemiya.
227. "Welfare Measurement for Local Public Finance," by David Starrett.
228. "Unemployment Equilibrium with Rational Expectations," by W. P. Heller and R. M. Starr.
229. "A Theory of Competitive Equilibrium in Stock Market Economies," by Sanford J. Grossman and Oliver D. Hart.
230. "An Application of Stein's Methods to the Problem of Single Period Control of Regression Models," by Asad Zaman.
231. "Tables of the Distribution of the Maximum Likelihood Estimate of the Slope Coefficient and Approximations," by Asad Zaman.
232. "Second Best Welfare Economics in the Mixed Economy," by David Starrett.
233. "The Logic of the Fix-Price Method," by Jean-Michel Grandmont.
234. "Tables of the Distribution of the Maximum Likelihood Estimate of the Slope Coefficient and Approximations," by T. W. Anderson and Takamitsu Sawa.
235. "Further Results on the Informational Efficiency of Competitive Stock Markets," by Sanford Grossman.
236. "The Estimation of a Simultaneous-Equation Tobit Model," by Takeshi Amemiya.
237. "The Consistency of the Maximum Likelihood Estimator in a Discrepancy Model," by T. Amemiya and G. Sen.
238. "Tables of the Distribution of the Maximum Likelihood Estimate of the Slope Coefficient and Approximations," by T. W. Anderson and Takamitsu Sawa.
239. "Numerical Evaluation of the Exact and Approximate Distribution Functions of the Two-Stage Least Squares Estimate," by T. W. Anderson and Takamitsu Sawa.
240. "Risk Measurement of Public Projects," by Robert Wilson.
241. "On the Capitalization Hypothesis in Closed Communities," by David Starrett.
242. "A Note on the Uniqueness of the Representation of Commodity-Augmenting Technical Change," by Lawrence J. Lau.
243. "The Property Rights Doctrine and Demand Revelation under Incomplete Information," by Kenneth J. Arrow.
244. "Optimal Capital Gains Taxation Under Limited Information," by Jerry R. Green and Eytan Shehshinski.
245. "Straightforward Individual Incentive Compatibility in Large Economies," by Peter J. Hammond.
246. "On the Rate of Convergence of the Core," by Robert J. Aumann.
247. "Unsatisfactory Equilibrium," by Frank Hahn.
248. "Existence Conditions for Aggregate Demand Functions: The Case of a Single Index," by Lawrence J. Lau.
249. "Existence Conditions for Aggregate Demand Functions: The Case of Multiple Indexes," by Lawrence J. Lau.
250. "A Note on Exact Index Numbers," by Lawrence J. Lau.
251. "Linear Regression Using Both Temporally Aggregated and Temporally Disaggregated Data," by Cheng Hsiao.
252. "The Existence of Economic Equilibria: Continuity and Mixed Strategies," by Partha Dasgupta and Eric Maskin.
253. "A Complete Class Theorem for the Control Problem and Further Results on Admissibility and Inadmissibility," by Asad Zaman.
254. "Measure-Based Values of Market Games," by Sergiu Hart.
255. "Altruism as an Outcome of Social Interaction," by Mordecai Kurz.
256. "A Representation Theorem for 'Preference for Flexibility,'" by David M. Kreps.
257. "The Existence of Efficient and Incentive Compatible Equilibria with Public Goods," by Theodore Groves and John O. Ledyard.
258. "Efficient Collective Choice with Compensation," by Theodore Groves.
259. "On the Impossibility of Informationally Efficient Markets," by Sanford J. Grossman and Joseph E. Stiglitz.

REPORTS IN THIS SERIES

321. "Efficiency of Resource Allocation by Uninformed Demand," by Theodore Groves and Sergiu Hart.
322. "A Comparison of the Box-Cox Maximum Likelihood Estimator and the Nonlinear Two Stage Least Squares Estimator," by Takeshi Amemiya and James L. Powell.
261. "Markings and the Valuation of Redundant Assets," by J. Michael Harrison and David M. Kreps.
262. "Autoregressive Modeling and Money: Income Causality Detection," by Cheng Hsiao.
263. "Measurement Error in a Dynamic Simultaneous Equations Model without Stationary Disturbances," by Cheng Hsiao.
264. "The Measurement of Deadweight Loss Revisited," by W. E. Diewert.
265. "The Elasticity of Derived Net Supply and a Generalized Le Chatelier Principle," by W. E. Diewert.
266. "Income Distribution and Distortion of Preferences: the ϵ Commody Case," by Mordecai Kurz.
267. "The n^2 Order Mean Squared Errors of the Maximum Likelihood and the Minimum Least-Square Estimators," by Takeshi Amemiya.
268. "Temporal Von Neumann-Morgenstern and Induced Preference," by David M. Kreps and Evan L. Porteus.
269. "Lake-Over-Bas and the Theory of the Corporation," by Stamford Grossman and Oliver D. Hart.
270. "The Numerical Values of Some Key Parameters in Econometric Models," by T. W. Anderson, Kimito Murumura and Takamitsu Sawa.
271. "Two Representations of Information Structures and their Comparisons," by Jerry Green and Nancy Stokey.
272. "Asymptotic Expansions of the Distributions of Estimators in a Linear Functional Relationship when the Sample Size is Large," by Naoto Kunitomo.
273. "Public Goods and Power," by R. J. Aumann, M. Kurz and A. Neyman.
274. "An Axiomatic Approach to the Efficiency of Noncooperative Equilibrium in Economies with a Continuum of Traders," by A. Mas-Colell.
275. "Tables of the Exact Distribution Function of the Limited Information Maximum Likelihood Estimator when the Covariance Matrix is Known," by T. W. Anderson, Kimito Murumura and Takamitsu Sawa.
276. "Autoregressive Modeling of Canadian Money and Income Data," by Cheng Hsiao.
277. "We Can't Disagree There," by John D. Gencakopulos and Hrachik Polermarchakis.
278. "Constrained Excess Demand Functions," by Herikh M. Polermarchakis.
279. "On the Bayesian Selection of Nash Equilibrium," by Akira Tomizuka.
280. "Disequilibrium Economics in Simultaneous Equations Systems," by C. Gourieroux, J. J. Laurent and A. Monfort.
281. "Duality Approaches to Microeconomics: Theory," by Takeshi Amemiya.
282. "A Time Series Analysis of the Impact of Canadian Wage and Price Controls," by Cheng Hsiao and Ohwatalayo Fukuyama.
283. "A Strategic Theory of Inflation," by Mordecai Kurz.
284. "Characterization of Vector Measure Games in $p\mathbb{N}^n$," by Yair Faamen.
285. "On the Method of Taxation and the Provision of Local Public Goods," by David A. Starrett.
286. "An Optimization Problem Arising in Economics: Approximate Solutions, Linearity and a Law of Large Numbers," by Sergiu Hart.
287. "Asymptotic Expansions of the Distribution of the Estimates of Coefficients in a Simultaneous Equation System," by Yasunori Fujikoshi, Kimito Murumura, Naoto Kunitomo and Masanobu Taniguchi.
288. "Optimal & Voluntary Income Distribution," by K. J. Arrow.
289. "Asymptotic Values of Mixed Games," by Abraham Neyman.
290. "Time Series Modeling and Causal Ordering of Canadian Money, Income and Interest Rate," by Cheng Hsiao.
291. "An Analysis of Power in Exchange Economics," by Martin J. Osborne.
292. "Estimation of the Reciprocal of a Normal Mean," by Asad Zaman.
293. "Improving the Maximum Likelihood Estimate in Linear Functional Relationships for Alternative Parameter Sequences," by Kimito Murumura and Naoto Kunitomo.
294. "Calculation of Bivariate Normal Integrals by the Use of Incomplete Negative-Order Moments," by Kei Takeuchi and Akinishi Takemura.
295. "On Partitioning of a Sample with Binary-Type Questions in Lists of Collecting Observations," by Kenneth J. Arrow, Leon Pesotchinsky and Milton Sobel.
296. "The Two Stage Least Absolute Deviations Estimator," by Takeshi Amemiya.
298. "Three Essays on Capital Markets," by David M. Kreps.
299. "Infinite Horizon Programs," by Michael J. P. Magill.
300. "Fictitious Outcomes and Social Log-Likelihood Matrices," by Peter Coughlin and Shmuel Nitzan.
301. "Notes on Social Choice and Voting," by Peter Coughlin.
302. "Overlapping Expectations and Hart's Conditions for Equilibrium in a Securities Model," by Peter J. Hammond.
303. "Directional and Local Fictitious Competitions with Probabilistic Voting," by Peter Coughlin and Shmuel Nitzan.
304. "Asymptotic Expansion of the Distributions of the Test Statistics for Overidentifying Restrictions in a System of Simultaneous Equations," by Kunitomo, Murumura, and Takada.
305. "Incomplete Markets and the Observability of Risk Preference Properties," by H. H. Pölemarchakis and L. Selden.
306. "Multiperiod Securities and the Efficient Allocation of Risk: A Comment on the Black-Scholes Option Pricing Model," by David M. Kreps.
307. "Asymptotic Expansions of the Distributions of k-Class Estimators when the Disturbances are Small," by Naoto Kunitomo, Kimito Murumura and Yoshihiko Tabada.
308. "Arbitrage and Equilibrium in Economies with Infinitely Many Commodities," by David M. Kreps.
309. "Unemployment Equilibrium in an Economy with Linked Prices," by Mordecai Kurz.
310. "Partial Optimal Equilibrium Under Uncertainty," by J. Dreze and E. Shehsinski.
311. "Cost Benefit Analysis and Project Evaluation from the Viewpoint of Productive Efficiency," by W. E. Diewert.
312. "An Introduction to Two-Person Zero Sum Repeated Games with Incomplete Information," by Sylvain Sorin.
313. "Estimation of Dynamic Models with Error Components," by T. W. Anderson and Cheng Hsiao.
314. "On Robust Estimation in Certainty Equivalent Control," by Anders H. Westlund and Hans Stenlund.
315. "On Industry Equilibrium Under Uncertainty," by J. Dreze and E. Shehsinski.
316. "Cost Benefit Analysis and Project Evaluation from the Viewpoint of Productive Efficiency," by W. E. Diewert.
317. "On the Chain-Store Paradox and Prediction: Reputation for Toughness," by D. M. Kreps and Robert Wilson.
318. "On the Number of Commodities Required to Represent a Market Game," Sergiu Hart.
319. "Evaluation of the Distribution Function of the Limited Information Maximum Likelihood Estimator," by T. W. Anderson, Kimito Murumura and Takamitsu Sawa.
320. "A Comparison of the Logit Model and Normal Discriminant Analysis when the Independent Variables are Binary," by Takeshi Amemiya and James L. Powell.
375. "Rational Cooperation in the Finite-Delay-Repeated Prisoner's Dilemma," by O. Kreps, P. Milgrom, J. Roberts, and R. Wilson.

376. "Necessary and Sufficient Conditions for Single-Peakedness Along a Linearly Ordered Set of Policy Alternatives" by P. J. Coughlin and M. J. Hinich.
377. "The Role of Reputation in a Repeated Agency Problem Involving Information Transmission" by W. P. Rogerson.
378. "Unemployment Equilibrium with Stochastic Rationing of Supplies" by Ho-mou Wu.
379. "Optimal Price and Income Regulation Under Uncertainty in the Model with One Producer" by M. I. Taksar.
380. "On the NTU Value" by Robert J. Aumann.
381. "Best Invariant Estimation of a Direction Parameter with Application to Linear Functional Relationships and Factor Analysis" by T. W. Anderson, C. Stein and A. Zaman.
382. "Informational Equilibrium" by Robert Kast.
383. "Cooperative Oligopoly Equilibrium" by Mordecai Kurz.
384. "Reputation and Product Quality" by William P. Rogerson.
385. "Auditing: Perspectives from Multiperson Decision Theory" by Robert Wilson.
386. "Capacity Pricing" by Oren, Smith and Wilson.
387. "Consequentialism and Rationality in Dynamic Choice Under Uncertainty" by P. J. Hammond.
388. "The Structure of Wage Contracts in Repeated Agency Models" by W. P. Rogerson.
389. "1982 Abraham Wald Memorial Lectures, Estimating Linear Statistical Relationships" by T. W. Anderson.
390. "Aggregates, Activities and Overheads" by W. M. Gorman.
391. "Double Auctions" by Robert Wilson.
392. "Efficiency and Fairness in the Design of Bilateral Contracts" by S. Honkapohja.
393. "Diagonality of Cost Allocation Prices" by L. J. Mirman and A. Neyman.
394. "General Asset Markets, Private Capital Formation, and the Existence of Temporary Walrasian Equilibrium" by P. J. Hammond.
395. "Asymptotic Normality of the Censored and Truncated Least Absolute Deviations Estimators" by L. L. Powell.
396. "Dominance-Solvability and Cournot Stability" by Herve Moulin.
397. "Managerial Incentives, Investment and Aggregate Implications" by B. Holmstrom and L. Weiss.
398. "Generalizations of the Censored and Truncated Least Absolute Deviations Estimators" by J. L. Powell.
399. "Behavior Under Uncertainty and its Implications for Policy" by K.J. Arrow.
400. "Third-Order Efficiency of the Extended Maximum Likelihood Estimators in a Simultaneous Equation System" by K. Takeuchi and K. Morimune.
401. "Short-Run Analysis of Fiscal Policy in a Simple Perfect Foresight Model" by K. Judd.
402. "Estimation of Failure Rate From A Complete Record of Failures and a Partial Record of Non-Failures" by K. Suzuki.
403. "Applications of Semi-Regenerative Theory to Computations of Stationary Distributions of Markov Chains" by
404. "On the Optimality of Individual Behavior in First Come Last Served Queues with Preemption and Balking" by Refael Hassin.
405. "Entry with Exit: An Extensive Form Treatment of Predation with Financial Constraints" by J. P. Benoit.
406. "Search Among Queues" by A. Glazer and R. Hassin.
407. "The Space of Polynomials in Measures is Internal" by J. Reichers and Y. Tauman.
408. "Planning Under Incomplete Information and the Ratchet Effect" by X. Freixas, R. Guesnerie and J. Tirole.
409. "A Theory of Dynamic Oligopoly, I: Overview and Quantity Competition with Large Fixed Costs" by Eric Maskin and Jean Tirole.
410. "Approximate Measures of the Social Welfare Benefits of Labor Projects" by Peter Hammond.
411. "Transversality Conditions for Some Infinite Horizon Discrete Time Optimization Problems" by Ivar Ekeland and Jose A. Scheinkman.
412. "Asymptotic Efficiency of the Partial Likelihood Estimator in the Proportional Hazard Model" by Aaron K. Hahn.
413. "A Monte Carlo Comparison of Estimators for Censored Regression Models" by Harry J. Paarsch.
414. "Instrumental-Variable Estimation of an Error-Components Model" by Takeshi Amemiya and Thomas E. MacCurdy.
415. "An Axiomatization of the Non-Transferable Utility Value" by Robert J. Aumann.
416. "Diffusion Approximation in Arrow's Model of Exhaustable Resources" by Darrell Duffie and Michael Taksar.
417. "The Shapley Value in the Non Differentiable Case" by Jean Francois Mertens.
418. "The Minimax Theorem for U.S.C.-L.S.C. Payoff Functions" by Jean Francois Mertens.
419. "Altruistic Growth Economies, Part I. Existence of Bequest Equilibria Part II. Properties of Bequest Equilibria" by Debraj Ray and Douglas Bernheim.
420. "On the Existence of Cournot Equilibrium" by William Novshek.
421. "Equilibrium Turnpike Theory with Constant Returns to Scale and Possibly Heterogenous Discount Factors" by Jeffrey L. Coles.
422. "Components of Variance in Manova" by T. W. Anderson.
423. "Prices for Homogenous Cost Functions" by Leonard J. Mirman and Abraham Neyman.
424. "On the Duration of Agreements" by Milton Harris and Bengt Holmstrom.
425. "A Sequential Signalling Model of Convertible Debt Call Policy" by Milton Harris and Arthur Raviv.
426. "On the Marginal Cost of Government Spending" by David Starrett.
427. "Self-Agreed Cartel Rules" by Kevin Roberts.
428. "Dynamic Models of Oligopoly" by Drew Fudenberg and Jean Tirole.
429. "A Theory of Exit in Oligopoly" by Drew Fudenberg and Jean Tirole.
430. "Consumer Information in Markets with Random Product Quality: The Case of Queues and Balking" by Rafael Hassin.
431. "Incentive Efficiency of Double Auctions" by Robert Wilson.
432. "Efficient Trading" by Robert Wilson.
433. "The Economic Theory of Individual Behavior Toward Risk: Theory, Evidence and New Directions" by Mark J. Machina.
434. "Reputations in Games and Markets" by Robert Wilson.
435. "Multilateral Incentive Compatibility in Continuum Economies" by Peter J. Hammond.
436. "The First Order Approach to Principal Agent Problems" by William P. Rogerson
437. "Maximum Rank Correlation Estimator and Generalized Median Estimator in Censored Regression and Survival Models" by Aaron K. Han.

List of Reports

- 438. "On Endogenous Competitive Business Cycles" by Jean-Michel Grandmont.
- 439. "A Complete Characterization of ARMA Solutions to Linear Rational Expectations Models" by George Evans and Seppo Honkapohja.
- 440. "Asset Bubbles and Overlapping Generations: A Synthesis" by Jean Tirole.
- 441. "Two Equivalence Theorems for the 'Finite Coalition Core' of a Continuum Economy" by Peter J. Hammond.
- 442. "Managerial Incentives and Non-Wage Benefits" by William Rogerson.
- 443. "A Survey of Agency Models of Organizations" by Daniel Levinthal.
- 444. "Two Papers on Sequential Bargaining: Part I. Sequential Bargaining Mechanisms. Part II. Bargaining with Incomplete Information an Infinite Horizon Model with Continuous Uncertainty" by Peter Cramton.
- 445. "Borrowing Constraints and Aggregate Economic Activity" by Jose A. Scheinkman and Laurence Weiss.